

Second-order cone optimization for unilateral contact with Coulomb friction

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Plan

- ① Model
- ② Painlevé-Klein example
- ③ SOCP reformulation
- ④ Theoretical interest
- ⑤ Numerical interest

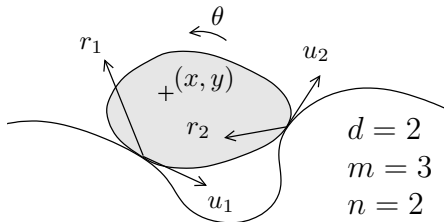
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Mechanical problem

Consider a mechanical system in dimension d ($d = 2$ or 3) with

- finitely many degrees of freedom: m
- finitely many contact points: n
- Coulomb friction at contact points
- inelastic impacts for simplicity



Notations

Problem: compute **one time step**

Unknowns:

- $\mathbf{v} \in \mathbb{R}^m$: (discretized) generalized velocities
- $\mathbf{u} \in \mathbb{R}^{nd}$: (discretized) relative velocities at contact points
- $\mathbf{r} \in \mathbb{R}^{nd}$: (discretized) contact forces or impulses

Previous example:

- $\mathbf{v} \approx (\dot{x}, \dot{y}, \dot{\theta}) \in \mathbb{R}^3$
- $\mathbf{u} \approx (u^1, u^2) \in \mathbb{R}^4$
- $\mathbf{r} \approx (r^1, r^2) \in \mathbb{R}^4$

Assumptions

linear dynamics

$$Mv + f = H^{\top} r \quad (1)$$

linear kinematics

$$u = Hv + w \quad (2)$$

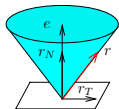
for given

- M (size: $m \times m$, symmetric positive)
- f (size: $m \times 1$)
- H (size: $nd \times m$)
- w (size: $nd \times 1$)

Assumptions

Given **normal** vector e , define **second-order cone** K_μ

$$K_\mu = \{\|r_T\| \leq \mu r_N\} \subset \mathbb{R}^3$$



Coulomb friction (at velocity level)

$$\left\{ \begin{array}{ll} \text{or: take-off} & r = 0 \text{ and } u_N \geq 0 \\ \text{or: stick} & r \in \text{int}(K_\mu) \text{ and } u = 0 \\ \text{or: slide} & r \in \partial K_\mu \setminus 0 \text{ and } u_N = 0 \\ & \text{with } u_T \text{ opposed to } r_T \end{array} \right. \quad (3)$$

We note (3) by

$$(u, r) \in C(\mu, e)$$

Known reformulations of $C(\mu, e)$

Coulomb's law (3) can be **equivalently** reformulated

Alart-Curnier

non-linear, non-smooth **equation** $f_{AC}(u, r) = r$ with

$$f_{AC}(u, r) = \begin{bmatrix} P_{\mathbb{R}^+}(r_N - \rho u_N) \\ P_{B(0, \mu r_N)}(r_T - \rho u_T) \end{bmatrix}$$

De Saxcé

complementarity constraint $K_\mu^* \ni \tilde{u} \perp r \in K_\mu$ with

$$\tilde{u} := u + \mu \|u_T\| e$$

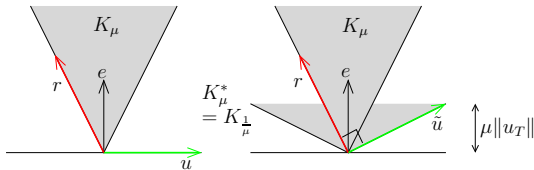
K^* : **dual** cone of K ; $K_\mu^* = K_{\frac{1}{\mu}}$

Interpretation of \tilde{u}

The change of variables

$$\tilde{u} := u + \mu \|u_T\| e$$

introduces **normality**



but the value of $\|u_T\|$ is unknown a priori !

Whole problem

- Finally, we want to solve the **incremental problem**

$$\begin{cases} Mv + f &= H^T r \\ u &= Hv + w \\ K_\mu^* \ni \tilde{u} &\perp r \in K_\mu \end{cases} \quad (4)$$

- algorithms** are available
 - Newton iterations on Alart-Curnier function
 - Uzawa iterations on De Saxcé's bipotential
 - many variants (fixed-points iterations, "Gauss-Seidel" ...)
- ... but algorithms sometimes **fail**
 - does a solution **exist** ?
 - if "yes", improve our algorithm !
 - if "no", does our problem make sense ?

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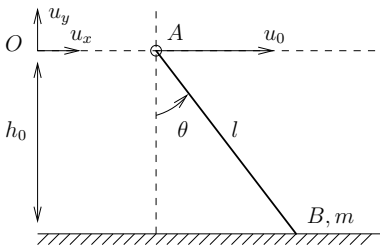
Example

Consider a **rigid bar** under **gravity** with $d = 2$ and

- imposed velocity u_0 in A
- one degree of freedom θ
- $v = 0$ at previous time step

Constants:

- **do not fix** yet $u_0 \neq 0$, μ and h_0 (or $\theta \in]0, \frac{\pi}{2}[$)
- other values fixed for convenience



Incremental problem

After time discretization

$$\left\{ \begin{array}{lcl} v & = & \cos(\theta)r_x + \sin(\theta)r_y - \sin \theta \\ u_x & = & \cos(\theta)v + u_0 \\ u_y & = & \sin(\theta)v \\ (u, r) & \in & C(u_y, \mu) \end{array} \right.$$

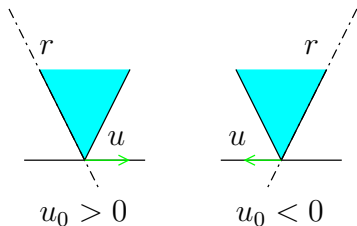
which can be solved by inspection

- one contact \rightarrow only three cases
- $d = 2 \rightarrow$ all constraints are linear

Solving by hand

Consider the **three possible cases**

- take-off: $r = 0$ implies $u_y < 0$, **impossible**
- stick: $u = 0$. If $u_0 \neq 0$, **impossible**
- slide: $u_y = 0$ implies $v = 0$ and $u_x = u_0$
(to be continued. . .)



Case $u_0 < 0$

If $u_0 < 0$,

- linear system (plus condition $r_y \geq 0$)

$$\begin{cases} \cos(\theta)r_x + \sin(\theta)r_y & = \sin(\theta) \\ -r_x + \mu r_y & = 0 \end{cases}$$

- solution is

$$r_y = \frac{\tan(\theta)}{\tan(\theta) + \mu} \geq 0$$

- condition $r_y \geq 0$ is **automatically satisfied**

A (unique) **solution exists**

Case $u_0 > 0$

If $u_0 > 0$,

- linear system (plus condition $r_y \geq 0$)

$$\begin{cases} \cos(\theta)r_x + \sin(\theta)r_y &= \sin(\theta) \\ r_x + \mu r_y &= 0 \end{cases}$$

- solution is

$$r_y = \frac{\tan(\theta)}{\tan(\theta) - \mu}$$

for $\tan \theta \neq \mu$ (otherwise, no solution)

- condition $r_y \geq 0$ gives:

$$\tan \theta > \mu$$

A solution exists if and only if $\tan \theta > \mu$

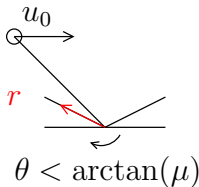
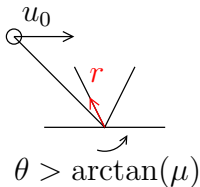
Conclusion

Finally...

A solution exists iff $u_0 \leq 0$ or $[u_0 > 0 \text{ and } \tan(\theta) > \mu]$

Coherent with intuition:

- when $\tan \theta > \mu$, friction torque acts **counter-clockwise**,
- **compensate** effect of gravity
- if $\tan \theta < \mu$, friction torque acts **clockwise**,
- and **increases** effect of gravity



Goal

- Given the data M, f, H, w (plus μ and e)
- provide a **checkable criterion**
- that ensures **existence** of a solution

Validation:

the criterion can be checked on the Painlevé-Klein example

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Reformulation

- Introduce **extra variable** s^i at each contact

$$s^i := \|u_T^i\| \quad (5)$$

- perform the **change of variables** (cf De Saxcé)

$$u \longrightarrow \tilde{u} := u + \mu es$$

incremental problem

$$\left\{ \begin{array}{lcl} Mv + f & = & H^\top r \\ \tilde{u} & = & Hv + w + \mu es \\ K_\mu^* \ni \tilde{u} \perp r \in K_\mu \end{array} \right. \quad (6)$$

Why should we do that ?

(6) are **KKT conditions** of two **convex** optimization problems
(SOCP: second order cone programs)

primal problem

$$\begin{cases} \min & J(v) := \frac{1}{2}v^\top Mv + f^\top v \\ & Hv + w + \alpha s \in K_\mu^* \end{cases} \quad (D_s)$$

dual problem

$$\begin{cases} \min & J_s(r) := \frac{1}{2}r^\top W r - b_s^\top r \\ & r \in K_\mu \end{cases} \quad (P_s)$$

with $W = HM^{-1}H^\top$ and $b_s = \alpha s + \beta$

Side note: when $\mu = 0$, incremental problem is a **QP** (Moreau)

Final reformulation

- Introducing

$$u(s) := \operatorname{argmin}_u(P_s) = \operatorname{argmin}_u(D_s)$$

practically **computable** by optimization software, and

$$F^i(s) := \|u_T^i(s)\|,$$

- the incremental problem becomes

fixed point problem

$$F(s) = s$$

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Assumption

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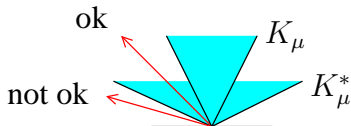
$$\exists v \in \mathbb{R}^m : H v + w \in K_\mu^*$$

- **Interpretation:** it is kinematically possible to enforce

$$u \in K_\mu^*$$

at each contact

- **not only** the intuitive $u_N \geq 0$!



Consequence

Using the assumption,

- the application $F : \mathbb{R}_+^n \rightarrow \mathbb{R}_+^n$ is **well-defined**
- it is **continuous**
- it is **bounded**
- apply Brouwer's theorem

Theorem

A fixed point exists

Application to the Painlevé example

For the example

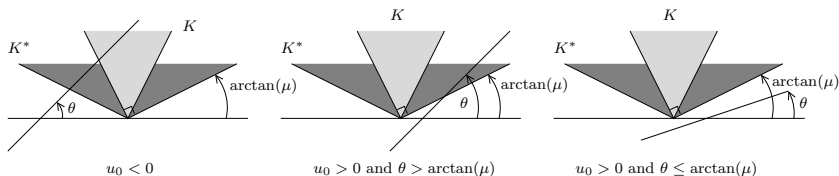
- the criterion is

$$\exists v \in \mathbb{R} ; (u_0, 0) + (\cos \theta, \sin \theta) v \in K_\mu^*$$

- we find **exactly**

condition

$$u_0 \leq 0 \text{ or } [u_0 > 0 \text{ and } \tan(\theta) > \mu]$$



Applicability of the criterion

- determine whether the intersection of a cone and a affine halfspace is **empty** or not
- easily **checkable** in general
- only a **sufficient** condition
- **necessary and sufficient** for Painlevé-Klein example ...
- ... and when $\mu = 0$ (QP case)
- **not true** in general

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Can this be used in practice ?

The fixed point equation $F(s) = s$ can be tackled by

- **fixed-point** iterations

$$s \leftarrow F(s)$$

- **Newton** iterations

$$s \leftarrow \text{Jac}[F](s) \backslash F(s)$$

- Variants possible (truncated resolution of inner problem. . .)

Does it work ?

- fixed-point iterations:
 - expensive
 - not very robust
- Newton:
 - usually **very few** iterations. . .
 - . . . but they are **expensive**
- **bottleneck**: SOCP solver
- practical interest is unclear yet
 - more robust ?
 - faster ?

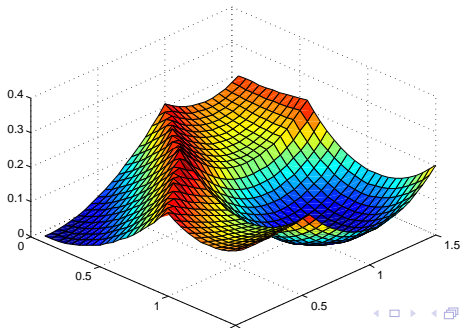
Illustration

- Toy problem: $d = 2$, $n = 2$ (a bead stuck in a corner)
- plotting

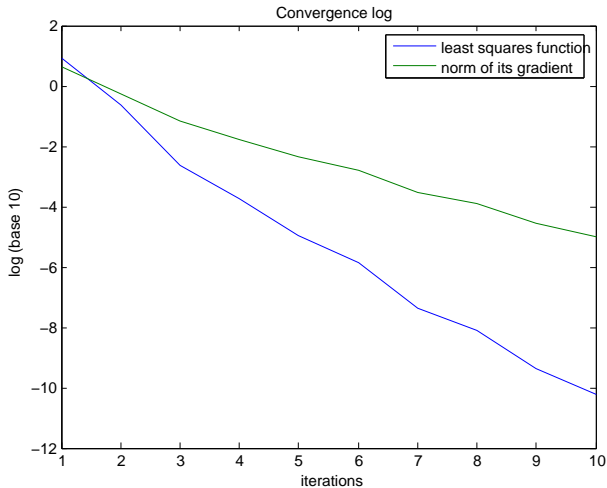
$$s \rightarrow \frac{1}{2} \|F(s) - s\|^2$$

observe

- non-smoothness...
- ...and non-convexity
- ...and non-uniqueness



Convergence log (3D, 100 contacts)



Summary

- a **new formulation** of (standard) incremental problem
- yields a checkable **existence criterion**
- and new **numerical prospects**

Side notes:

- anisotropic friction could be handled
- non-linear dynamics as well

Thanks for your attention !

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Thanks for your attention !